

Case Studies 2022L

Ceteris Paribus profiles

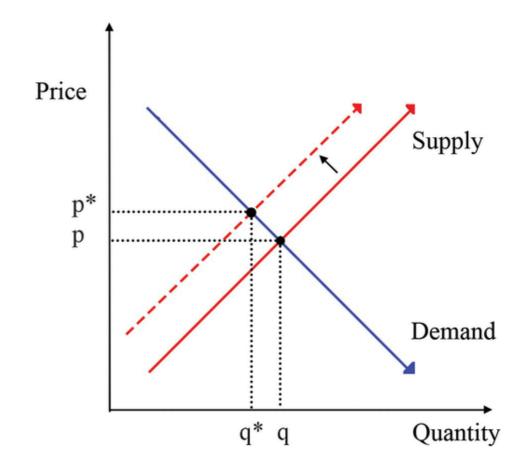
Mar 31, 2022

Ceteris-Paribus

Ceteris-paribus means all other things held constant.

Factors that can impact inflation rate:

- cost of production
- prices of goods
- demand for goods
- skill labor availability
- new technology
- current money supply
- ...



Ceteris-Paribus Profiles

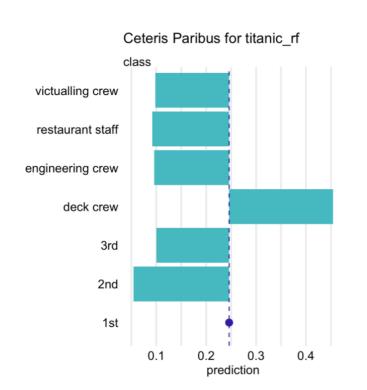
- This method is based on the ceteris-paribus principle.
- Ceteris Paribus (CP) profiles are designed to show model response around a single point in the feature space.
- The main goal is to understand how changes in the values of the variable affect the model's predictions.
- The CP profile is a kind of tool known as "What-if" (how a model's prediction would change if the value of a single exploratory variable changed) explainer.

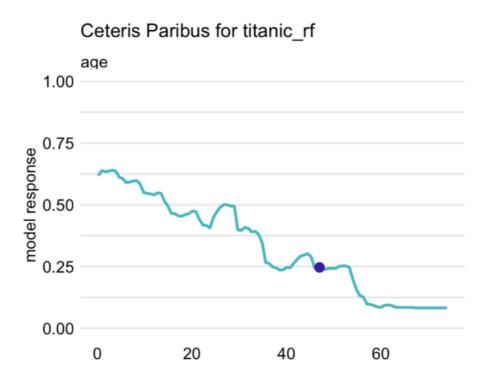
Ceteris-Paribus Profiles

A one-dimensional CP profile h() for model f(), the j-th explanatory variable, and point of interest x as follows:

$$h_x^{f,j} = f(x^{j|z})$$

CP profile is a function that describes the dependence of the conditional expected value of Y on the value z of the j-th explanatory variable. In practice, z assumes values from the entire observed range for the variable, while values of all other explanatory variables are kept fixed at the values specified by x.





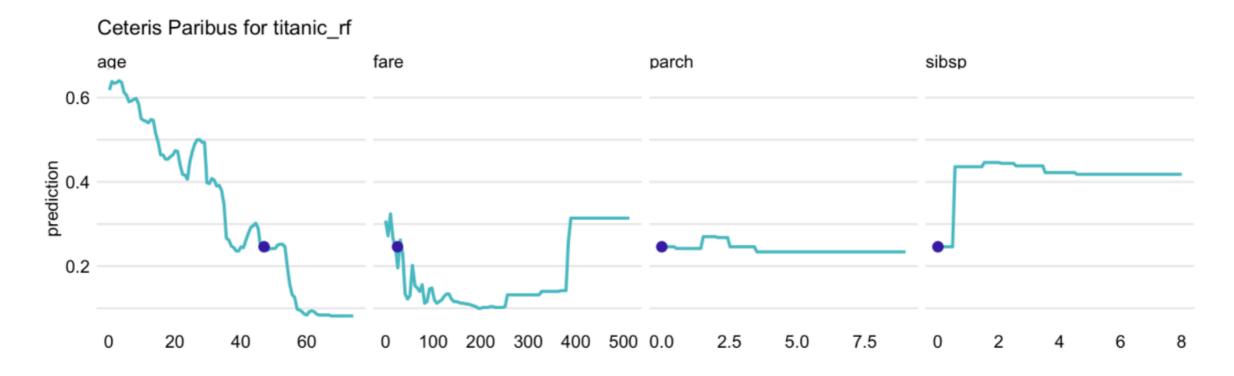
blue dot observed value of the observation for the variable

A) CP for categorical variable

B) CP for continuous variable

Ceteris-Paribus Profiles

The ML models contain a large number of variables, the CP profiles are legible even for tiny subplots:



sibsp: number of siblings/spouses aboard parch: number of parents/children aboard

Pros and Cons

- + graphical representation is easy to understand and explain.
- + easy to compare for two or more models to better understand difference between the models.
- + compare two or more instances to better understand model-prediction's stability.
- presence of correlated explanatory variables may lead to misleading results. Because it is not possible to keep one variable fixed while varying the other one.
- the presence of interactions in a model.
- the number of plots to inspect may be daunting in case of a model with hundreds and thousands of variables.





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